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# MOLECULAR BREEDING: THE NATURAL APPROACH TO PROTEIN DESIGN

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ple related genes by a process that closely mimics sexual recombination to generate functionally diverse libraries of chimeric proteins from which improved variants can be selected. Molecular breeding effects the permutation of diversity within a pool of related sequences and has proven to be an extraordinarily effective method to evolve proteins and pathways cates we know today precedes Mendel's genetic studies by many millennia. Despite their lack of a formalized understanding, our ancestors harnessed the evolutionary power of sexual recombination of preexisting natural diversity to produce plants and animals with characteristics better suited to their needs. A recent advance in protein design, termed molecu-The breeding of wild plants and animals into the agricultural domestilar breeding, allows protein engineers to homologously recombine multior better function.

#### I. INTRODUCTION

by a process of selective breeding—a process as simple as mating one's two favorite dogs or saving the cream of the crop for next spring's things that bring pleasure, such as a pet dog or flowers. Most of these are not at all like what they were 5000 years ago. In fact, many have Just look around. Look at what nature has provided—things for basic changed dramatically in only the last 100 years. This was accomplished necessities, such as the corn in breakfast cereal and cotton for clothing;

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certain directions useful to him" (Darwin, 1859). Apart from the nature natural variation within a population is the base material on which evolution and breeding depend. In addition to the similarity between planting. Of breeding, Darwin states: "The key is man's power of accumulative selection: nature gives successive variations; man adds them up in of selective pressure, Darwin recognized that the principles operating in the domestication and breeding of plants and animals were indistinguishable from those operating in natural selection. He recognized that breeding and natural selection, Darwin recognized that there must be a mechanism generating variation within the population from which nature or a breeder selects.

are selectively propagated in nature or by a breeder. Accumulation of be it natural or imposed, can result in remarkable modifications from The block-wise exchange of homologous regions of chromosomes, which occurs during meiosis in sexually reproducing organisms (Roeder, Ogunseitan, 1995), is by far the major generator of diversity. Preexisting diversity present within a population of organisms is shuffled to produce a better mixture of beneficial alleles and fewer deleterious alleles; these accelerating evolution is evidenced by its chimeric signature in genes sequence identity by up to 23% (Smith et al., 1991). The diversity of life, both extinct and extant, and the rapidity with which microorganisms 1997) and during genetic exchange in bacteria (Matic et al., 1995; new variants. The fitter or more desirable organisms are those bearing beneficial alleles over multiple generations under selective pressure, ancestral organisms. The role of homologous DNA recombination in that have endured selective pressure. For example, the penicillin-binding proteins of  $oldsymbol{eta}$ -lactam resistant Neissena species show complex patterns of recombination between at least six ancestral species, differing in DNA evolve (e.g., see van der Meer et al., 1992) are testaments to the effective mechanisms nature has developed and breeders have tapped to improve useful plants and animals (Burbank et al., 1914). Recognizing the power of selective breeding, protein engineers have captured sexual recombination in the test tube to rapidly improve the products of genes. The highly active, functionally diverse gene libraries generated by molecular breeding have extended directed evolution to a plethora of proteins for which only limited throughput screens are feasible (Chang et al., .999; Christians et al., 1999; Minshull and Stemmer 1999; Ness et al.,

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1999; Patten et al., 1997; Zhang et al., 1997). Molecular breeding has also been extended beyond proteins to pathways and viruses, as well as partial genomes (Crameri et al., 1997; Soong et al., 1999)

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# II. THE NEED FOR BETTER PROTEINS

of streptokinase (Wong et al., 1994; Wu et al., 1998) for the therapeutic enzymes. In contrast to chemical catalysts, enzymes are nontoxic, biodefeedstocks. In chemical synthesis, the exquisite specificity (substrate-, regio-, and stereo-selectivity) and efficiency of enzymes can obviate the purification. In addition, enzymatic processes generally require more moderate reaction conditions and simpler, more flexible production units. The use of biocatalysts (both enzymes and whole cells) as benign nations for the production of food and drink, such as the malting of 1994), the synthesis of acrylamide (Kobayashi et al., 1992), and the use degradation of arterial blood clots. There are many benefits from using gradable, and can be produced by fermentations of cheap, renewable need for protecting and deprotecting groups and simplify end-product alternatives to chemical catalysts for producing renewable chemicals, barley and its fermentation to beer. Today enzymes have found many fructose corn syrup (Bhosale et al., 1996; Hagedorn and Kaphammer, pharmaceuticals, polymers, and fuels is integral to realizing current Our ancestors learned to exploit a variety of natural enzymatic transforapplications. Examples include the multi-enzymatic production of high visions of sustainable development (Nedwin, 1997).

Despite these advantages, there are discrete performance limitations set of substrates and under the precise conditions (temperature, ionic strength, pH, etc.) of their natural niche. The efficiency of enzymes components, thus wild-type enzymes often are unstable and prone to chemical and biological degradation. Although these characteristics provide a benefit to a cell in nature, they are suboptimal for the biotechnologist hoping to exploit a biocatalyst. The substitution of an enzyme for hours, capable of functioning under reaction conditions alien to its natural milieu (such as extremes of temperatures and pH or in the presence of organic solvents), able to use nonnatural substrates, and These limitations originate in the natural physiological role that biocataysts play. Most enzymes have evolved to function optimally on a narrow allows for their transient use and for a cell to recycle their amino-acid a chemical process often requires that the protein is active for many that have impeded biocatalysts from realizing their industrial potential. cost effective relative to alternative chemical catalysts. 265

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Proteins are also used clinically to treat a variety of diseases. Erythropoietin stimulates erythrocyte production in kidney dialysis and chemotherapy patients. Granulocyte stimulating factor enhances immune systems compromised by cancer treatments. Cytokines such as interferons and interleukins are used for their anti-viral and anti-tumor activities. Other proteins are used to inhibit or stimulate blood clotting. For the most part, the pharmaceutical protein industry relies on cloning native human genes and expressing and purifying their products in recombinant form.

cal pathway, it may also increase harmful or even fatal side effects due only one of the pathways would clearly be desirable. Another limitation As with proteins used as biocatalysts, natural human proteins may require optimization for use as pharmaceuticals. One frequent limitation is protein half-life. Another is selectivity. Cytokines often bind to multiple receptors on different cell types, with different physiological responses relevant dose of a protein pharmaceutical may activate a targeted biologito activation of secondary pathways. In this case, a cytokine that activated of naturally occurring proteins is that they often require high doses ogous system is another property that could be improved, as was done for the expression of the jellyfish green fluorescent protein (GFP) in Escherichia coli (Crameri et al., 1996). The strategies described below are most frequently related to enzyme activity, yet they clearly also apply to modifying the properties of interest in proteins for pharmaceutical and resulting from the different binding events. Thus, while a therapeutically (milligrams to grams), making their use as therapeutics economically impractical. Yield of active recombinant protein production in a heterola plethora of other uses.

# III. STRATEGIES FOR OPTIMIZING PROTEINS

Natural selection and classical breeding both employ the same empirical strategy of creating variants and selecting those that perform best—that is the essence of all protein tailoring methods. They differ only in the sources of sequence variation and the methods by which this diversity is target.

#### A. Natural Diversity

The most reasonable source of starting points is nature. If one protein does not perform exactly as required, perhaps a homolog isolated from a different organism will. For example, an enzyme that functions well in high salt conditions may best be isolated from a halophile. On

the other hand, properties such as lack of product inhibition or ability to function in an organic solvent may never be found by searching through nature, simply because a cell's survival has never depended on these characteristics. Naturally occurring proteins can be thought of as analogous to the wild ancestors of modern crops or domesticated animals: good starting points, but unlikely to possess the full range of properties required for human purposes (Diamond, 1997). A different source of variants is to take an available protein whose function most closely approximates that desired, and make and test variations on that sequence.

# 8. Variations on a Single Sequence

#### 1. Rational Design

Although recent advances for visualizing proteins as the dynamic strucmay be built to desired specifications, the prospect of designing proteins for specific functions is still a long way off. into the gene by methods such as oligonucleotide-directed mutagenesis that no matter how good the available structural data, the variants frehas proven fruitful and general strategies for tailoring a few properties are slowly being illuminated, the approach is impeded by assumptions of protein folds (Dahiyat and Mayo, 1997) hint at a future when proteins Structure-based protein design relies on knowing the structure of a protein and on tools for molecular modeling to predict favorable amino acid changes. A small number of promising modifications are introduced (Kunkel et al., 1991), and the effects tested. This method tests only a small number of variations. However, our understanding of protein function, structure, folding, and interaction is still sufficiently imprecise quently fail to show the desired improvements. Although the approach tures they are (Arnold and Ornstein, 1997) and for the de novo design that discount the complexity of biological systems (Rubingh, 1997).

#### 2. Random Point Mutations

Iterated random point mutagenesis coupled with a screen or selection to evolve an improved protein (Arnold, 1998a; Shao and Arnold, 1996) is a strategy for molecular evolution that stems from classical strain improvement of industrial microorganisms (described below). Random point mutagenesis of the gene for the protein to be improved is typically performed by error-prone PCR (Arnold, 1998a; Cadwell and Joyce, 1992; Cadwell and Joyce, 1994; Chen and Arnold, 1991; You and Arnold, 1996), but exposure to chemical mutagens (Taguchi et al., 1998), or

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mutator strains (Bornscheuer et al., 1998; Low et al., 1996) have also been used. Because most mutations are detrimental or neutral (Shafikhani at al., 1997; Suzuki et al., 1996), a low mutation frequency is employed to generate approximately one to two amino acid changes per protein. A sample of the library is subjected to an appropriate selection or screen to identify those variants that have the desired improvements. The process is repeated with the single best performer, often with increasingly stringent evolution of an improved protein by stepwise accumulation of single mutations. The advantage of this method, in contrast to structure-based engineering or random cassette mutagenesis, is that little or no information regarding protein structure and function is required, and few mutations and the inherent limitations of an asexual evolutionary process selection pressure or screening criteria. The result is the "asexual" assumptions are made. Further, the process generally provides new protein sequences with measurable improvements in a desired activity in relatively small libraries (~104/iteration). Amino acid changes contributing to an evolved phenotype are frequently scattered throughout the protein sequence; changes whose effects could not have been accurately predicted or calculated (Arnold, 1998a; Spiller et al., 1999). The unbiased nature of the process affects diverse aspects of protein activity Despite the success of iterated mutagenesis compared to rational apthat accumulates mutations at a rate of only about one per cycle (disthat are not easily modeled, such as transcription, translation, protein clones commonly have improvements in several of these properties. proaches, the process is still impeded by the low quality of random folding, and protein-protein interaction with host systems. Individual cussed below).

# 3. Oligonucleotide Randomization

above is that it is limited to single point mutations. Only one nucleotide fourteen amino acids could only be accessed by double- or triple-base mutations). Because the amino acids that are accessible with a single tive than fully random. However, saturation mutagenesis is a way to circumvent this bias, for example, by using a cassette containing a ran-A feature of random point mutagenesis by the methods described in any codon is usually changed, which means that on average less than six amino acids may be accessed (Jespers et al., 1997) (the remaining residue, this important bias results in mutations that are more conservadomized codon to replace the native codon with an equal mixture of all possible codons (Reidhaar-Olson et al., 1991). Because this approach base mutation tend to be conservative replacements for the original is the most mutagenic, it can only be applied to a small part of a protein

out a polypeptide, and the low quality of random mutations that requires duced into a critical region, such as the substrate binding pocket of subsets of amino acids (Arkin and Youvan, 1992). Variations of this and recursive ensemble mutagenenesis (Delagrave et al., 1993; Delagrave rational approaches are employed to identify regions of a gene to target by random mutagenesis. Screening the mutant clones for variants of desired function identifies random mutational solutions lying within the targeted region. This approach has found success (Black et al., 1996), rational criteria, the ability to identify critical, contiguous regions for mutagenesis, the fact that beneficial mutations are often found throughthe testing of large libraries when multiple random changes are introan enzyme. The latter limitation can be reduced by using a biased randomization, for example, 70% of the wild-type base and 10% of each of the other bases (Reidhaar-Olson et al., 1991) or doping for desired method include scanning saturation mutagenesis (Chen et al., 1999) and Youvan, 1993). These processes all increase the genetic variation accessible at a codon (or contiguous series of codons); however, the methods require construction of many libraries for complete scanning and is used primarily when enough structural information is available to target a certain area, but not enough for designing and testing specific single mutations. This approach therefore lies between the purely structural-based and random approaches. Molecular modeling and other but remains limited by several factors. These include its imposition of of a protein and are difficult to iterate.

## C. Recombination of Diversity

A fundamental difference between the mutagenesis methodologies of fitness resulting from deleterious mutations in asexual populations previously described and the examples of natural evolution and breeding described in the Introduction (Section I) is the role played by recombination. Homologous recombination has two major effects on an evolving ystem. First, it avoids reinventing the wheel: Once a mutation that confers an improved phenotype has entered a population, recombinaion allows it to be tested in combination with all other beneficial muta-(Muller's ratchet) (Muller, 1964). Not only is recombination a feature show dramatic increases in the speed and range of evolution when tions, rather than all of these combinations having to be derived de novo. Second, it allows efficient removal of deleterious mutations by replacing them with wild-type sequence, thereby avoiding the downward spiral of all biological systems, but computational simulations of recombination recombination is included in the algorithms (Forrest, 1993; Gibson, MOLECULAR BREEDING: THE NATURAL APPROACH TO PROTEIN DESIGN

tion. The sexual process of molecular breeding (Stemmer, 1994a; Stemshuffling) was developed to mimic this essential feature of natural evolumer, 1994b) has supplanted iterated random mutagenesis as the most efficient and rapid method for directing the evolution of nucleic acids 1989; Holland, 1975; Kelly, 1994). Molecular breeding (also called DNA and proteins.

can prime homologous regions of different DNA sequences by template switching. In addition, the level of mutagenesis can be adjusted with the tation and reassembly of DNA (Fig. 1). In this format, DNA from a pool of selected mutants is randomly fragmented (e.g., with DNase I) and reassembled in a primerless DNA amplification reaction. The reassembly reaction is recombinogenic because fragments from one DNA sequence appropriate choice of DNA polymerase and reaction conditions (Zhao The most widely used format for molecular breeding is in vitro fragmenand Arnold, 1997c).

# 1. Recombination of Single Sequences by DNA Shuffing

ing (Stemmer, 1994b) of genes that encode improved variants is a The power of the combinatorial nature of DNA shuffling was first demonstrated using the TEM-1  $\beta$ -lactamase (Stemmer, 1994b). When expressed in E. coli, the TEM 1 \(\beta\)-lactamase provides low-level resistance pooling of the most cefotaxime resistant mutants improved resistance from a minimal inhibitory concentration (MIC) of  $0.02~\mu \mathrm{g/ml}$  to resulted in a mutant that was 32,000-fold more drug resistant. Backcrossmethod to identify beneficial mutations while flushing out neutral and to the poorly hydrolyzed antibiotic cefotaxime. Three cycles of DNA shuffling (error-prone, to create the initial diversity), selection, and 320  $\mu$ g/ml for a 16,000-fold increase in resistance. Two rounds of backcrossing (i.e., shuffling with a molar excess of the parental gene) deleterious mutations (Zhao and Arnold, 1997b). In addition to improved turnover, this mutant retained a promoter mutation that resulted in a twofold increase in expression over the parental enzyme, illustrating the ability of DNA shuffling to solve a problem through more than one route.

the known structure of the TEM-1 \(\beta\)-lactamase, three active site loops were randomized separately (Palzkill and Botstein, 1992). These separate libraries yielded the key E104K and G238S mutations, resulting in fourcreate combinations of distant, separately selected residues. In a previous approach to increase cefotaxime resistance by molecular modeling of and eight-fold increases in cefotaxime resistance, respectively. In combi-This example demonstrates both of the recombination-derived advantages of DNA shuffling. The first advantage is that DNA shuffling can

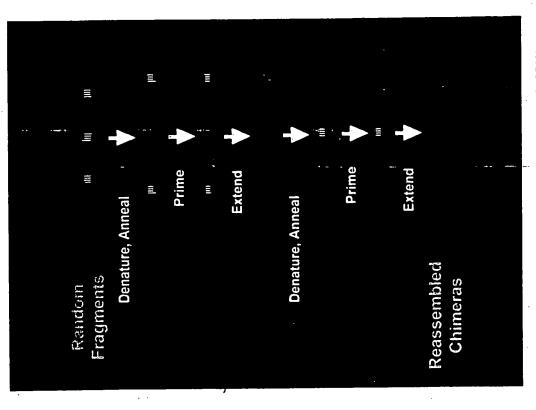


Fig. 1. DNA shuffling by fragmentation and reassembly. A pool of DNA sequences is randomly fragmented (e.g., by treatment with DNase I). The gene fragments are assembled into a library of full-length chimeric genes by repeated cycles of denaturation, annealing, and DNA polymerase extension.

though shuffling quickly yielded this double mutation (in addition to the libraries constructed in separate loops based on rational design nation, however, these two changes result in a 500-fold increase. Alother mutations that provided a further sixty-four-fold improvement),

have yielded the combination of the two key mutations, and the 500of such deleterious mutations by replacement with wild-type sequence via recombination is efficient, but reversal of deleterious mutations by strated in the example of GFP evolution by DNA shuffling (Crameri at in fluorescence were present in a single mutant following the first round of mutagenesis. The effect of two subsequent rounds of shuffling was could not yield such a combination mutant. The second advantage of experiment using three cycles of error-prone PCR resulted in only a fold increase in MIC, the combination was not seen in practice, probably as a result of the much higher rate of deleterious mutations. Reversal error-prone PCR is very inefficient. This second advantage is also demonal, 1996). All three of the mutations that resulted in a 45-fold increase simply to remove three additional mutations by recombination with wildrecombination is the purging of the excess of deleterious mutations, which tend to mask the effect of the beneficial mutations. A control sixteen-fold improvement. Although in principle this method should type sequences within the pool.

effectively discards all except the single best mutation, as well as combinations of mutations that were painstakingly identified in the previous cycle. Iterated cycles of DNA shuffling of a single starting gene using substrate specificity (Zhang et al., 1997), improved protein folding The ability of DNA shuffling to generate a large number of new molecules is the key accelerator of directed evolution, since the mutain nonrecombination approaches the single best parent is typically selected as the sole parent to create the mutant library (either by random or rational mutagenesis) that is to be screened in the next cycle; this random point mutations as a source of diversity have been successively (Crameri et al., 1996), thermostability (Giver et al., 1998), solvent tolerance (Moore et al., 1997), and resistance to chemical modification combinations of beneficial mutations that originated on separate DNA tions are often additive or even synergistic in effect (Chen and Arnold, used to evolve proteins with enhanced activity (Stemmer, 1994b), altered (Matsumura et al., 1999). Table I summarizes a selection of published 1991; Matsumura et al., 1986; Shaw et al., 1999; Wells, 1990). By contrast, examples of DNA shuffling of a single starting sequence.

used format for DNA shuffling, a number of alternative methods have been developed. All rely on the same underlying principle that the most efficient way to explore all possible combinations and permutations of sequences is by recombination. Two proved alternative methods of DNA Although DNase I fragmentation and reassembly is the most widely shuffling are the staggered extension process or StEP (Zhao et al., 1998) and in vivo shuffling in Saccharomyces cervisiae (Cherry et al., 1999). Shuf-

Systems Improved by DNA Shuffing of a Single Starting Sequence TABLE I

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System	Comments	Reference
Single Proteins TEM-1 β-lactamase	3 cycles of shuffling and 2 cycles of backcrossing, 32,000-fold increase	Stemmer, 1994
B-galactosidase	7 cycles, 66-fold increase in fucosidase specific activity, 1000-fold increase in substrate specificity	Zhang <i>et al.</i> , 1997
Green fluorescence protein	3 cycles, 45-fold improvement in fluorescence as a result of improved protein folding	Crameri <i>et al.</i> , 1996
Human antibody	8 cycles of shuffling and 2 cycles of backcrossing, >440-fold increase in audity	Crameri <i>et al.</i> , 1996
Mouse antibody	100-fold increase in expression level	Crameri <i>at al.</i> , 1996
Fathways Arsenate degradation pathway	3 cycles, 40-fold improvement in arsenate resistance	Crameri et al., 1997

fling by random primers (Shao et al., 1998) is not currently widely prac-

plates with different beneficial mutations and flanking oligonucleotide polymerization step to generate partially extended fragments, which undergo template switching during subsequent cycles of the fragment StEP is a PCR-like reaction consisting of a mixture of full-length temprimers. In contrast to PCR, StEP employs an extremely abbreviated reassembly reaction. Although StEP can be carried out in a single tube, crossover frequencies are limited by the rapidity with which cycles can be performed.

the target sequence. Vector replication requires recircularization of the fragments and vector by a series of in vivo recombination events in the homologous overlapping regions. As little as 15 to 30 bp of contiguous ping DNA fragments (e.g., restriction fragments) that together comprise identity is all that is required for recombination in yeast (Manivasakam In vivo DNA shuffling in S. cerevisiae uses the cell's highly efficient double-strand DNA break repair pathway to obtain recombination. Yeast cells are co-transformed with a linearized vector and a series of overlap-

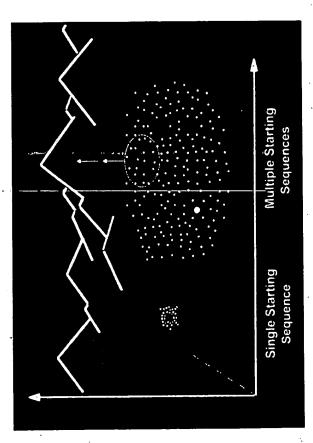
of alternative recombination formats (in vitro, in vivo, and combination methods), the in vitro methods such as fragmentation and reassembly are currently preferred for most applications due to their versatility Although we have developed and are continuing to develop a range and control.

## 2. Recombination of Multiple Homologs from Natural Diversity by DNA Shuffling

dog genomes that can differ by over a million different single base tolerated suggests that perhaps many of the mutations have already been selected for function and permutability. By contrast, ten generations of randomly mutating dogs will produce a very sick dog rather than a useful The diversity of sequence variations that exists in natural populations of diversity that has proved itself functional and useful. Although this "knockout" mutants, yet in dog breeding where one is shuffling two mutations, most of the puppies that are born are fully functional, suggesting high library quality. Such a result could only be obtained if this large pool of natural diversity was extremely conservative. The fact that such of organisms is likely to be very old and highly stable. It is a reservoir "proved" diversity originated from random mutagenesis, it is much more conservative. For example, introduction of random single aminoacid mutations into a typical protein leads to a high level of nonfunctional a large fraction of the new combinations of this diversity are so well new breed.

of active members, with a high degree of phenotypic diversity. The permutation of natural sequence diversity encoding amino-acid changes changes have been accumulated over millions of years. In the example given above, only genes that function within the context of an entire functional dog have persisted. Similarly, for a single gene, nature has only maintained sequences that are functional within the sequence and structural context of the entire protein and within the complex environment of the whole cell. However, together with the sequence divergence, there has been divergence in a range of properties of gene families. For example, enzymes have evolved to function in diverse physical and chemical conditions (Narinx et al., 1997), to accept new substrates (Scanlan and Reid, 1995), or even to perform fundamentally different chemical reactions (Babbitt at al., 1995). Receptors and ligands have diverged as they co-evolved, maintaining tight binding with each other, but greatly reduced binding to the receptor ligand pairs that have co-evolved in other species. Consequently, as with dog breeding, exchanging blocks of these sequences results in a library containing a large proportion On the level of the individual gene as well as of the entire organism,

barriers. In addition, molecular breeding is fast with a cycle time of days differ from either parent, so the molecular breeding of the genes encodbut different molecules. However, unlike classical breeding, molecular preeding is not limited to two parents and thus bypasses natural species pling is obtained because the exchange of large sequence blocks by shuffling means that neighboring mutants generally differ at multiple amino-acid positions (Fig. 2). Just as the recombination of dog genomes resulting from sexual reproduction produces functional offspring that ng a closely related family of proteins results in a library of functional rather than months or years required for a cycle of classical breeding combinations of characteristics from any of the parents and therefore epresents a broad but sparse sampling of sequence space. Sparse samand neutral mutations, as well as deletions and insertions, produces ibraries of progeny that are quite different in sequence and in their



results in a sparse sampling of a much greater area of sequence space, allowing much Searching sequence space by molecular breeding versus random mutagenesis of a single starting sequence. Random mutagenesis yields clones with a few point muta-Family shuffling yields chimeras that typically have many changes relative to parental sequences and other progeny. At equal library size, the increased sequence diversity more promising regions to be found and subsequently explored at increased sampling tions. The approach is suitable for "hill climbing" to a local performance maximum. density (Crameri et al., 1998).

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Classical Breeding versus Molecular Breeding TABLE II

Classical breeding	Molecular breeding
Cycle time = years	Cycle time = days
Whole genome	Genes, pathways, genomes
Breed within species	Breed across species
Two parents	One to many parents
Limited control	Multilevel control
Complex selection pressure	Focused selection pressure
Whole plants and animals	Applicable to microbes, cells, whole organisms

nants was tested for ability to confer increased bacterial resistance to Screening 50,000 members of this library produced a variant that was different from its closest parent at over 25% of its amino acids and conferred 270-fold greater resistance to moxalactam than did the best parent. This compares with an up to eightfold improvement found by single sequence DNA shuffling of any of the four parent genes separately (Fig. 3, see color insert). This enzyme also conferred resistance to a to 82% amino-acid identity (Crameri et al., 1998). A library of recombimoxalactam, an antibiotic that is poorly degraded by  $ampC\beta$ -lactamases. The first published example of molecular breeding of natural diversity involved the recombination of four  $\mathit{ampC}$   $\beta$ -lactamases that shared 58%number of other B-lactams.

The shuffling of twenty-six subtilisins and over twenty human interferbreeding to generate high quality and functionally diverse libraries of ons are two recent examples that demonstrate the power of molecular useful proteins that serve as rich sources of hits when screened for desired properties (Chang et al., 1999; Ness et al., 1999)

previously unscreened clones from a single round of recombination, a parent interferon, Hu-IFN-α2a. A second round of shuffling yielded a than twenty human a interferons that shared nucleotide homologies of 85% to 95% (much greater than in the eta-lactamase example previously activity, measured by the protection of murine cells against a challenge with lymphocytic choriomeningitis virus, and positive pools were then deconvoluted. Using a total of sixty-eight assays to screen a library of 1672 variant was identified with 135,000-fold greater specific activity than the Interferons. The evolution of pharmaceutical proteins by molecular breeding has recently been demonstrated by Chang et al. (Chang et al., 1999). They built a high quality a-interferon library by shuffling more cited). The library was screened as pools of clones for increased antiviral

contained no new point mutations, suggesting that these clones are fold higher specific activity than Hu-IFN-\alpha1, and four-fold more active than the most potent murine interferon, Mu-IFN-24, despite the fact that the human and murine sequences are only about 65% identical composed of multiple segments from known human interferons, and variant with a 285,000-fold higher specific activity than Hu-IFN-02a, 185-(Fig. 4, see color insert). Importantly, the best three clones were all much less likely to be immunogenic.

an activity greater than that of the natural mouse protein. Sequences with murine cells. Even though it was not possible to reconstruct the exact sequence of murine aninterferon from the human genes, it was been evolutionarily separated for over 100 million years. Consequently, the murine interferons differ from all of the human interferons at fiftysimply by recombining human sequences, to produce an interferon with that had been "pre-tested" in humans to function as  $\alpha$ -interferons contained the information necessary to build a protein that functions well Mice and humans (and their respective cytokines and receptors) have six to seventy-two amino-acid positions. Nevertheless, it was possible, possible to reconstruct its function.

tant serine endoproteases, valued for a range of applications, perhaps most industrial enzymes, incremental improvements in performance are of industrial enzymes is that performance is not defined by any single property, but by a complex mix of parameters. Although rational design and random mutagenesis can improve single properties, such as thermofamily of proteins is that of subtilisin. Subtilisins are commercially impormost notably as additives to laundry detergents for hydrolysis and solubiliabout \$500 million, it is not surprising that subtilisin is one of the best Bryan et al., 1986; Graycar et al., 1999; Kano et al., 1997; Russel and fersht, 1987; Wells and Estell, 1988; You and Arnold, 1996). As with significant. A major challenge in the rational design or directed evolution stability or activity in organic solvent, it is often at the expense of other critical properties (Patkar et al., 1998; Shoichet et al., 1995), making it difficult to obtain an enzyme that is optimized for several of the important performance criteria. Just as multiple traits in plants and animals can be recombined by classical breeding, multiple enzyme properties can zation of protein stains (Bott and Betzel, 1996). With annual sales of understood proteins and a frequent target for improvement using both structure-based design and random mutagenesis (Ballinger et al., 1996; be recombined by molecular breeding. Ness et al. (Ness et al., 1999) demonstrated this by using DNA shuffling to breed twenty-five subtilisin Subtilisins. A second example of molecular breeding of a large

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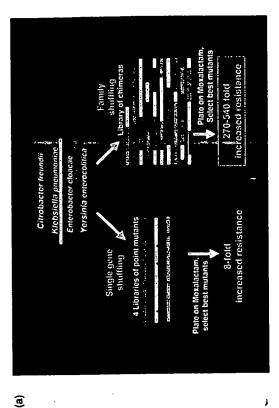
Fig. 3. (a) Comparison of single sequence shuffling and family shuffling of cephalosporinase. (b) Computer model of winning chimera created from the known structure of the Enterbadae cloacae protein (Crameri et al., 1998; Lobkovsky et al., 1993). The predicted structure of the a-chain backbone is within an r.m.s deviation of O.766Å from the known structure. The segments derived from Enterobacter are shown in blue, those from Klebsiella are shown in yellow, and those from Citrobacter are shown in green. The thirty-three amino acid point mutations are shown in red. The enzyme differs by 102 amino acids from the Citrobacter enzyme, by 142 amino acids from the Klebsiella enzyme, and by 196 amino acids from the Yersinia enzyme.

Fig. 4. Summary of antiviral activities of native and evolved IFN-αs. The antiviral activities of purified protein for native Mu-IFN-αs and Hu-IFN-αs as well as evolved IFN-αs on murine L929 cells are shown. One unit of activity corresponds to half-maximal protection from lethal ECMV viral challenge. Arrows on the right indicate fold improvement of the winning IFN-α (IFN-α-CH2.1) relative to Hu-IFN-α1 and Hu-IFN-α2a (Chang et al., 1999).

Fig. 5. Activities of 654 active clones from the shuffled subtilisin library compared to twenty-six parents. Relative activities of each clone in five screens are plotted as concentric circles. Each color represents one of the five screening conditions: pH5.5 (orange), pH7.5 (blue), pH10 (dark red), thermostability (yellow), and activity in 35% DMF at pH 7.5 (green). The area of the circle is proportional to the activity in the five assays relative to the best parent in each assay.

gene fragments obtained from a panel of mesophilic Bacillus isolates with the full-length gene for Savinase, a leading industrial protease (Graycar et al., 1992; Hastrup et al., 1989). The diversity of subtilisins used was much greater than that used in the interferon and  $\beta$ -lactamase examples. Pairwise identities of the DNA sequences were as low as 56.4% (protein sequences homology as low as 63.7%). A small library of 654 active clones was screened for thermostability, solvent stability, and pH dependence (at pH5, pH7.5, and pH10), three properties that are of commercial importance for subtilisin and of general concern for other industrial enzymes and biocatalysts.

The vast array of functional diversity generated in this experiment is shown in Figure 5 (see color insert). The frequency of improved clones ranged from 4% to 12% of the active library in any single parameter. In addition, the diversity of combinations of properties ranged well beyond the properties of the parental enzymes. Sequence analysis of some of the best performing clones under each set of conditions revealed that variants with similar properties could be encoded by very different sequences. Thermostability, for example, could be conferred by any one of at least three different genetic elements. In many applications, a



Fic. 3a

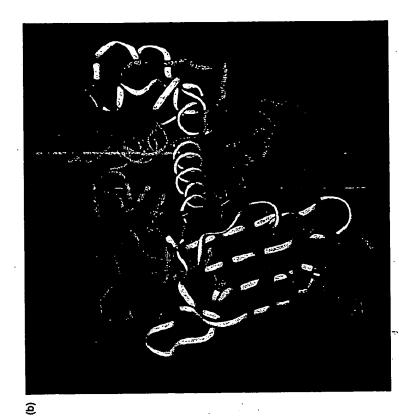


Fig. 3b

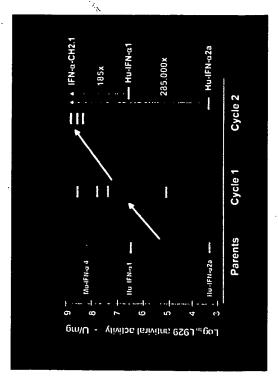
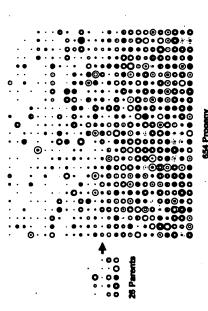


FIG. 4



family of natural sequences is known, but for historical reasons all of the characterization has focused on only one of the family members, typically one whose structure has been determined. Molecular breeding allows less-well characterized sequence homologs (and even partial or inactive sequences) to be incorporated into the breeding pool in any molar ratio desired. The screening of pluripotent enzyme libraries generated by molecular breeding of a handful of homologs provides an economical alternative to rational design or bioprospecting for leads that meet the multiple parameters required for commercialization. In addition, the ability of molecular breeding to demarcate functional sequence elements is likely to be a valuable tool for building structure-function databases for guiding protein design in the future. Table III summarizes a selection of published examples of molecular breeding of multiple related sequences.

#### IV. SCREENING IS KEY

As Darwin observed, the only difference between the breeding of domestic plants and animals and the evolution of wild organisms is how the selection is applied. In nature, adaptation occurs in response to the environment: Diverse ecological niches give rise to a diversity of organisms to exploit them. Organisms undergo a very low level of random mutagenesis and those mutations that confer a competitive advantage (such as the ability to utilize a new nutrient source, survive at a higher or lower temperature, or kill a neighbor) are maintained in organisms that consequently grow and colonize a new niche.

TABLE III Systems Improved by Molecular Breeding of Homologous Sequences

System	Comments	Reference
Cephalosporinase	4 sequences, 58%-82% DNA identity, 1 round, 270-540-fold increase in antibiotic resistance	Crameri, Raillard & al. 1998
Thymidine kinase	2 sequences, 78% DNA identity, 4 rounds, 32-16,000-fold decrease in levels of AZT	Christians, Scapozza et
a-interferon	required to sensitize Escherichia coli >20 sequences, 85%-95% DNA identity, 2 rounds, 185-285,000-fold improvement in	al, 1999 Chang, Chen et al, 1999
Subtilisin	specific activity 26 sequences, 56%-99% DNA identity, 1 round, up to 4-fold improvement in 5	Ness, Welch et al., 1999
	properties	

In classical breeding, the criteria for survival are altered to favor human needs and many of the restraints of natural selection are removed. For example, with people to protect them from predators, cattle are no longer subject to all the rigors of competing in the wild. Humans select and breed from those animals with the highest milk and meat productivity, while alertness and aggression are not only no longer required, but are in fact characteristics that detract from the "performance" of a large domesticated mammal. In a similar way, enzymes used in industrial processes need not be constrained by what is useful to an organism in the wild. For example, a property like product inhibition, which is a critical function of cellular economics, is no longer desirable. The protein economics attempts to subvert the function of the enzyme to be maximally productive and stable under conditions dictated by bioprocess engineers. Like breeders, protein engineers select those enzymes that perform best under the desired conditions.

The challenge of protein design by molecular breeding is the formulation of a screen that precisely emulates the final process conditions. This can be difficult to do in a high throughput format. A powerful approach is the employment of multitiered screens that sample decreasing numbers of clones with increasing scrutiny, ultimately ending with a handful of variants that are tested in the final process. Variants with improved performance under process conditions are carried forward to the next cycle of alteration and screening.

been limited to the identification of polypeptides (mostly antibodies Smiley and Benkovic, 1994), catalysis or intracellular function have not Smith et al., 1998; Winter et al., 1994), and ribosome display (Hanes et and peptides) that bind tightly to a desired ligand. Although creative exceptions have been reported (Baca et al., 1997; Janda et al., 1994; been conveniently addressed, nor has the technology realized general All evolutionary screens require some way to link phenotype with genotype. Recent technologies for linking genotype and phenotype have expanded the accessible library size by many orders of magnitude. For 1994; Roberts and Szostak, 1997) provide access to libraries of  $10^9$ – $10^{14}$ variants. Unfortunately, screening these libraries remains limited to priexample, cell surface display (Daugherty et al., 1998; Daugherty et al., 1999; Georgiou et al., 1997), phage and virus display (Hodits et al., 1995; al., 1999; Hanes et al., 1998; Hanes and Pluckthun, 1997; Mattheakis et al., marily affinity enrichment. For this reason applications have generally application such as screening for catalysis.

In some situations it is possible to develop a way to use genetic selection to identify mutants (Black and Loeb, 1993; Naki et al., 1998). By coupling

of cryptic functions). In addition, selections often have a limited dynamic undesirable solutions, and must confirm that a phenotype is linked to to a naive cell). Perhaps the main limitation is that a genetic selection for a particular problem is not always obvious. When available, selections are most useful as the first tier ("filter") of a multitiered screening program, which needs to be followed by subsequent, lower throughput ants (using combinatorial infection) can be tested. However, the aprange. Moreover, it is difficult to distinguish between the specific activity of an enzyme and an increase in its expression level. In general, one must evaluate promising variants from several different angles to avoid the gene of interest (i.e., that plasmids from survivors confer viability gene function to cell survival (e.g., the acquisition of an essential nutrient, the destruction of a toxic compound, or the ability to activate or complement an existing host metabolic pathway), up to about 1012 variproach is limited by the fact that cells under selective pressure often find unexpected ways to grow (e.g., via genetic reversion or activation but higher veracity screens to evaluate the positive clones.

Fluorescence-based cell sorting also allows screening of large numbers of variants (10<sup>5</sup>–10<sup>9</sup>). In general, this requires that a fluorescent product is formed and then retained within the cell. An elegant example is the evolution of a P450 enzyme to use hydrogen peroxide in place of the normal NADH cofactor in the hydroxylation of aromatic substrates (Joo et al., 1999). Cells containing active horseradish peroxidase were transformed with a P450 library. Hydroxylated aromatic compounds were linked by the peroxidase to form fluorescent compounds that could then be detected by FACS or digital imaging. The intensity of the fluorescence increased with activity of the P450. In addition, different hydroxylation products resulted in different fluorescence spectra, so that an indication of regioselectivity could be obtained.

Agar plate screens allow the rapid analysis of up to 10<sup>6</sup> different colonies. Screenable phenotypes include enzymes that give rise to a colon or fluorescence change in a diffusible substrate (Yang, 1994) or that form a halo around a producing cell because of the degradation of a insoluble substrate, such as the proteolysis of casein in agar plates containing skim milk (Cunningham and Wells, 1987). Plate-based bioassays can be used to detect and quantitate the production of a toxic compound (such as an antibiotic) as a zone of killing of an overlaid tester strain around the producing colony. Coupling of an agar plate-based screen with automated colony picking of positive clones provides a powerful first screen in a multi-tiered screening approach (Ness et analys).

Conditions can typically be manipulated in microtitre plates to give a variants tend to compromise the characteristics for which the variants way to reduce the number of candidates, it is essential to progress to a more accurate screen before doing additional cycles of recombination. reasonable approximation of the final process conditions. With a robotic it is possible to test up to 106 variants in microtiter plates. In cases demanding a more complicated screen, such as an assay for stereoselectivity (Janes and Kazlauskas, 1997), about 10t clones can be screened in microtiter plates. Finally, manufacturing conditions can be even better simulated in flasks, fermentors, or small reactors, using the protein in its final whole-cell or purified protein form. Low throughput but accurate physical methods such as HPLC, mass spectroscopy, and gas chromatography measure catalytic activity accurately. These high veracity methods are useful as the final assay in a round of directed evolution to ensure that the positive variants really have the required activities In general, assays that quickly analyze an enormous population of are screened, sacrificing veracity and appropriateness for increased system and a simple homogeneous fluorogenic or chromogenic assay, throughput. Consequently, while a high capacity assay may be an efficient and properties.

For example, in the a-interferon example, only sixty-eight assays were to perform a small number of assays directly in complex conditions which assays cannot otherwise be obtained, such as yield, drought When optimizing a single property in model systems, such as thermostability or tolerance to an organic solvent, simple high throughput screens have proved adequate (Zhao and Arnold, 1997a). However, to address more complex problems, such as the generation of an be required. In such cases, molecular breeding of multiple sequences from natural diversity is the best way to generate high-quality libraries that cover a very large area of mostly functional sequence space, so used to obtain a significant functional improvement in the first described show that the libraries created by molecular breeding can be of unusually high quality. This general approach makes it feasible that correlate closely with the final commercial application. We foresee screening small, high-quality libraries of clones directly in whole transgenic plants or animals, especially for whole organism traits for improved pharmaceutical protein, a much more elaborate screen may that very few variants need to be tested to obtain the required changes. cycle of shuffling. The interferon and subtilisin examples previously resistance, or disease resistance.

#### BEYOND PROTEINS

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# Molecular Breeding of Multigene Phenotypes

able feedstocks to high value chemical products in a single reactor and comprise a multibillion dollar industry. Fermentation products range from commodity chemicals such as ethanol, organic acids, and amino acids, to high-value small molecule pharmaceuticals, protein pharmaceuticals, and industrial enzymes. Similar to enzymes, whole cell biocatalysts isolated from nature seldom demonstrate the required properties to function under the constraints of a commercial process and thus require specific improvements, such as increased yield of desired products, removal of unwanted co-metabolites, improved utilization of inexpensive carbon and nitrogen sources, and adaptation to fermenter conditions. Success in bringing biocatalytic processes to market and competing in those markets relies on the ability to continuously improve the biocatayst. The scientific and commercial efforts to understand and manipulate specific functions of whole cells have created the disciplines of metabolic Although most of the previously mentioned methods and examples have focused on improvement of the isolated protein product of a single gene, whole cell biocatalysts make up the majority of industrial biocataysts. Industrial microorganisms effect the multistep conversion of renewengineering and industrial strain improvement.

genetic tools and information database required to attempt the calcuimprovement is robust but suffers from limitations that are typical of improvement. Although years of intensive research have yielded the widely practiced strategy is classic strain improvement, which employs Current strategies for strain improvement rely on the empirical and terative modification of fermenter conditions and genetic manipulation of the whole cell biocatalyst. The genetic manipulation of industrial microorganisms has traditionally taken two paths: the rational approach of metabolic engineering and the empirical approach of classic strain lated manipulation of a number of established industrial organisms, metabolic engineering suffers from its reliance on the assumptions of a rational approach. Furthermore, the method and experience gained is typically species-specific and not easily transferred to newly discovered or poorly characterized microorganisms. For these reasons, the most random point mutagenesis (chemical or UV) of the producing strain and screening for mutants that have improved properties. Classic strain iterated point mutagenesis (described above). Molecular breeding, which simulates classical breeding, accelerates whole cell improvement 283

by removing the limitations of metabolic engineering and classical strain improvement.

amplifying the expression of genes encoding "rate limiting" enzymes (2) the introduction of exogenous genes, which convert a metabolite All these approaches closely resemble structure-based design of proteins in that they rely on a great deal of information and are often limited by invalid assumptions. The interpretation of biological data is domiengineering studies have demonstrated that cellular physiology is extremely robust, and that well-conceived genetic perturbations often result in little or no change in phenotype. Even severe changes to primary have been shown to have negligible effects on primary metabolic fluxes or growth rate in E. coli (Sauer et al., 1999). Complex biological systems classes: (1) enhancing the flux through a desired metabolic pathway by and those resistant to feedback inhibition (see Jetten et al., 1994); of the host organism to a desirable chemical at a viable yield (see Camprecursors by the disruption of genes encoding competing pathways. nated by information considered "known" about the system under investigation. This occurs even though the "known" data set is intrinsically incomplete due to the complexity of biological systems. Recent metabolic metabolism, such as the deletion of the genes encoding pyruvate kinase, from single enzymes to whole cells continue to resist rational manipulation but succumb to empirical approaches, such as mutagenesis and eron and Tong, 1993); and (3) decreasing the diversion of chemical The strategies of metabolic engineering generally fall into three screening, which rely on few assumptions.

Each of the three strategies of metabolic engineering has demonto represent a rate limiting step or eliminating feedback regulation of pathway enzyme(s) can be a productive means of enhancing flux through desired pathways (class 1 above). However, this approach often results in only a small increase in rate since other genes affecting the pathway become rate limiting. The term "rate-limiting step" is misleading since the rate through a metabolic pathway is generally limited by a collection of enzymes rather than a single enzyme step (Fell, 1998). Metabolic networks are tightly controlled and have evolved to prevent the unnecessary buildup of toxic or useless intermediates. Participating enzymes function at similar rates and under similar conditions to avoid these under feedback regulation. For example, the biosynthetic enzymes of the aspartate derived amino-acid pathway are under multiple levels of strated value, yet each is limited by its assumptions and the "cut and paste" nature of genetic engineering. Overexpressing gene(s) believed scenarios, and more than a single enzyme in a given pathway may be regulation (Eikmanns et al., 1993). Therefore, a small increase in meta-

cellular conditions imparted by the bioprocess. This strategy assumes expression balance within the pathway, eliminating feedback inhibition, improving ka and K for the pathway enzymes, and adaptation to the polic flux resulting from gene overexpression may be accompanied by ing of the genes that encode the pathway enzymes followed by screening the resulting libraries for the desired phenotype provides a direct route to unbiased genetic solutions. This approach allows the improvement of the individual components of the system-for example, improving a buildup of undesired or detrimental intermediates. Molecular breedonly that a genetic solution exists within the DNA that is shuffled.

ways is one of the most powerful methods for generating new biocatalysts (class 2 above), but poor functioning of the cloned genes often hampers the success of this approach. Genes and gene products have adapted to function in the environment of their native hosts, and these environthe encoded polypeptides may not fold properly. Basic genetic elements The cloning of heterologous genes to generate new metabolic pathments are specific to the organisms and their ecological niches. For different organisms, but the physical and chemical states of the cells example, enzymes from thermophilic organisms do not function well in mesophilic hosts. Heterologous genes may be poorly expressed and and the identity of the primary metabolites may be similar between can be significantly different. The concentration of metabolites, pH, performance of an enzyme; further, the structure of macromolecules interactions. Thus, a metabolic pathway transplanted from one organism to another may not function optimally. Indeed, the cytoplasmic state of a cell under the conditions of fermentation will be different from that experienced in its natural environment, and even a native pathway may not function optimally. Shuffling heterlogous or native genes and screening them for performance under the desired bioprocess conditions provides a means to identify variants of those genes that have adapted to the new cellular environment and are functioning optimally. The ability of DNA shuffling to alter the substrate preference of enzymes also allows one to access promiscuous activities of enzymes and evolve them to temperature, and ionic strength will differ, each influencing the optimal with which an enzyme might interact will differ, compromising functional function productively in the context of new metabolic pathways.

The deletion of competing pathways is also a productive route to increasing flux through a desired pathway or at least eliminating potential contaminating products (class 3 above) (Hols at al., 1999). However, the removal of a known pathway may be insufficient to divert flux through the desired pathway, since flux may be limited by either the kinetic parameters of the pathway enzymes or by external factors. Further, the

option. The goal is to divert maximal flux down the desired pathway while maintaining the minimal necessary flux through the competing pathway(s) to allow survival. An intrinsic value of the directed evolution approach is that it allows one to find this balance within a complex system. This often is not possible in a straight metabolic engineering balance in which flux through the desired pathway is maximized, while competing pathway may be essential and its elimination may not be an Simultaneous shuffling of both pathways should produce an optimal maintaining only the necessary flux through any competing pathway. 'all-or-nothing" strategy.

(a forty-fold improvement). Analysis of the new operon identified two chromosome and this shuffling-dependent integration was shown to complex and non-intuitive solutions that arise from a directed evolution DNA shuffling has been demonstrated to improve the heterologous improve the function and stability of enzymes under a variety of extreme environmental conditions. Improvement of single genes by DNA shuffling results in the alteration of the expression, structure, and function of the gene product. In contrast, improvement of metabolic pathways by DNA shuffling results in the alteration of the individual genes (as above) as well as complex interactions of the gene products with each other and the cellular environment. In this way, DNA shuffling complements the strategies of metabolic engineering and provides access to the complex genetic solutions required of strain improvement goals. Crameri et al. demonstrated the productivity of this approach by the evolution of the Staphylococcus aureus arsenate resistance operon to impart increased resistance to arsenate in E. coli (Crameri et al. 1997). The pathway consisted of three genes encoding an arsenate reductase, an arsenite efflux pump, and a regulatory protein. Previous rational work suggested that any improvements required would be found in the arsenate reductase. After three rounds of shuffling and screening, a variant of the operon imparting a resistance to 0.5 M arsenate was identified major surprises: most of the thirteen mutations were clustered in the efflux pump with no mutations found within the coding region of the reductase, and the originally episomal plasmid had integrated into the contribute a large part of the improvement. These data emphasize the approach and demonstrate the utility of molecular breeding to optimize expression of proteins, alter the substrate specificity of enzymes, and the function of a complete metabolic pathway.

#### Genome Shuffling

Long before molecular geneticists began tinkering with the structure and function of proteins and metabolic pathways, researchers were ma-

those that are recognized as "necessary and sufficient." Although imwhen the entire structural gene is targeted as opposed to only those regions known to encode the active site. Similarly, the most productive mode of improving whole cell biocatalysts is through the evolution of the cell's entire genome. The robust nature of classical strain improveis relevant. The improvement of enzyme function is most productive ment lies in the fact that it is unbiased and can address complex, distributed phenotypes. The superior performance of classical strain improvement over metabolic engineering is a testament to this fact. The ment process and thereby significantly accelerates the process. It provides the means to recombine the genomic information from many strains superior organism. Useful mutations are combined and deleterious mutations are replaced with wild-type sequence. Instead of accumulating a single beneficial genetic event per cycle of mutagenesis and screening, evolution occurs via large leaps by creating complex combinations of Although metabolic engineering requires a great deal of information and molecular tools, classical strain improvement requires only a starting phenotypes are complex and are influenced by many more genes than set of genes, other elements distributed throughout the genome may have equal or greater influence. Again, an analogy with protein design limitations to classical strain improvement are the same as those of sequential point mutagenesis—the process is asexual. Improvements are Genome shuffling incorporates recombination into the strain improveso that the useful alleles from all of them can be combined into a single nipulating the performance of industrial microorganisms by classic strain improvement. These classical approaches remain an important part of all strain improvement programs, primarily because they are robust and reproducibly yield new strains with slightly improved phenotype. organism, a mutagen, and a good screen for improvement. Cellular provements in phenotype may be accessible by variations within a defined small and one can accumulate only one beneficial mutation at a time. multiple mutations.

#### VI. CONCLUDING REMARKS

Our preferred method for molecular breeding involves recombination of homologous genes obtained from nature, in order to permutate the proven diversity. These libraries are high quality (rich in functional sequences) because the variations have been prescreened for function in nature and phenotypically diverse. In rare cases when adequate natural diversity is not available, such as when homologous sequences are not known or if the target is a small segment of a protein, the sequence

diversity must be generated artificially. Typical methods include random mutagenesis of a single DNA sequence followed by screening for the best mutations, various kinds of synthetic oligonucleotide cassette mutagenesis of a small part of a protein, or mutations that were suggested based on molecular modeling of the protein's structure.

tions of previously selected mutations, whether the targets are single However, regardless of the source of variation, recombination by DNA shuffling is the most effective method for creating higher order combinagenes, pathways, or whole genomes.

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# ANALYSIS OF LARGE LIBRARIES OF PROTEIN MUTANTS USING FLOW CYTOMETRY

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#### I. INTRODUCTION

One of the most intriguing problems in directed protein evolution is determining the optimal strategy for exploring the sequence space and solating gain-of-function, change-of-function, or stability mutants. The could be assayed for enzymatic function by liquid or plate assays was most widely adopted experimental strategy is the iterative search of ibraries containing low rates of random nucleotide substitutions (Arimitations as well as theoretical considerations: Assaying for enzyme unction is generally tedious and represents the rate limiting step in ibrary screening. Until recently, the number of independent clones that nold, 1998). This approach has been dictated by both experimental imited to around  $5 \times 10^5$  clones (Joo et al., 1999). If a low rate of small enough to be screened by conventional agar plate or microtiter well assays. In addition, a low rate of mutagenesis is considered necessary to maintain the fraction of deleterious mutations at a tolerable level mutagenesis is used, a large fraction of all the possible amino-acid substi utions ("sequence space") may be represented in a library that is stil Kuchner and Arnold, 1998).

The iterative screening of relatively small libraries of mutants with a low frequency of nucleotide substitutions has proved to be extremely effective for the functional improvement of numerous proteins and has literally changed the way we think about protein design (Arnold, 2000). However, as high throughput screening methodologies are becoming

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# **Evolutionary Protein Design**

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